

# Improving the efficiency of clinical trials in multiple sclerosis

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## Abstract

**Background:** Phase 3 clinical trials for disease-modifying therapies in relapsing-remitting multiple sclerosis (RRMS) have utilized a limited number of conventional designs with a high degree of success. However, these designs limit the types of questions that can be addressed, and the time and cost required. Moreover, trials involving people with progressive multiple sclerosis (MS) have been less successful.

**Objective:** The objective of this paper is to discuss complex innovative trial designs, intermediate and composite outcomes and to improve the efficiency of trial design in MS and broaden questions that can be addressed, particularly as applied to progressive MS.

**Methods:** We held an international workshop with experts in clinical trial design.

**Results:** Recommendations include increasing the use of complex innovative designs, developing biomarkers to enrich progressive MS trial populations, prioritize intermediate outcomes for further development that target therapeutic mechanisms of action other than peripherally mediated inflammation, investigate acceptability to people with MS of data linkage for studying long-term outcomes of clinical trials, use Bayesian designs to potentially reduce sample sizes required for pediatric trials, and provide sustained funding for platform trials and registries that can support pragmatic trials.

**Conclusion:** Novel trial designs and further development of intermediate outcomes may improve clinical trial efficiency in MS and address novel therapeutic questions.

**Keywords:** Multiple sclerosis, clinical trials, platform trials, adaptive trial designs, Bayesian statistics, futility trials

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## Introduction

Phase 3 clinical trials for disease-modifying therapies (DMTs) in relapsing-remitting multiple sclerosis (RRMS) have evolved from a limited number of Phase 2/3 designs and have led to successful development of multiple drugs used as monotherapies. However, clinical trials for progressive multiple sclerosis (MS) have been less successful, as have trials of rehabilitation therapies.<sup>1,2</sup> Traditional Phase 3 designs are not well-suited to test complex treatment strategies. Moreover, they have constraints related to the types of questions that can be addressed, who participates, and the time and cost required. Therefore, alternatives such as platform and adaptive designs with appropriate intermediate and primary outcomes may

be more efficient and appropriate depending on the question being asked and the population being considered. The increasing adoption of electronic health records that may support registry-based trials, acceptance of more pragmatically designed trials, and acceptance of Bayesian designs also offers the opportunity to accelerate testing of therapies for progressive MS and to address novel questions. In December 2022, an international group of investigators in MS, epidemiology, biostatistics, rehabilitation, and clinical trial design met under the auspices of the International Advisory Committee on Clinical Trials in MS, sponsored by the European Committee on Treatment and Research in MS and the US National MS Society (see Supplemental Appendix 1). Based

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on that meeting, we review novel designs and the role of intermediate and composite outcomes as mechanisms to improve clinical trial design efficiency and to answer new questions. The use of real-world data in observational study designs to evaluate treatment effectiveness is reviewed elsewhere.<sup>3,4</sup>

### Novel designs

Clinical trials exist on a continuum between explanatory (i.e. efficacy—does the intervention work under ideal conditions) and pragmatic (i.e. effectiveness—does the intervention work under usual conditions). The Pragmatic–Explanatory Continuum Indicator Summary 2 (PRECIS-2) wheel allows investigators to consider and describe how pragmatic or explanatory their trial will be, considering multiple elements.<sup>5</sup> These include participant eligibility and recruitment, setting, organization (for delivery of the intervention), degree of flexibility with respect to delivery and adherence by participants, follow-up, the primary outcome, and the primary analysis. For example, a pragmatic trial may be embedded within a registry which is used as the mechanism for recruitment, data collection, and follow-up (COMBAT-MS Trial (NCT03193866), HOPE-Covid19 Supplemental Appendix Box e1).<sup>6</sup> Most trials testing interventions in MS to date fall on the more explanatory end of the spectrum. These trials employ strict inclusion and exclusion criteria to minimize heterogeneity in the population,<sup>7</sup> randomize participants, and rigorously control delivery of the intervention and its assessment. Regulators consider these criteria when labeling drugs for use,<sup>8</sup> yet these trials may not adequately inform practice because the populations enrolled may not reflect those seen in clinical practice, the investigators may be more experienced and conduct more frequent assessments thereby enabling earlier detection and mitigation of harms, and adherence to the intervention may be higher. These issues are not unique to studies of pharmacologic interventions. Consequently, benefits of the intervention may be overestimated and harm underestimated. These designs are also poorly suited to testing complex treatment strategies, such as whether initiation of higher efficacy versus lower efficacy DMT after diagnosis of MS produces better long-term clinical outcomes without increased harm, treatment de-escalation, or (complex) rehabilitation interventions.<sup>9,10</sup> Also, many clinical trials in MS have used conventional trial designs with pre-specified treatment arms, fixed sample size (or number of events), and one primary final analysis. This has contributed to high costs and the slow pace of drug development, which is a particular concern for progressive MS, where a few approved therapies exist.

Pragmatic and novel trial designs seek to address some of the limitations of conventional clinical trials (see Table 1 for key features, strengths, limitations, and potential applications). Pragmatic trials may cost less for the investigator to conduct while retaining the benefits of randomization, but larger sample sizes may be required due to smaller effect sizes. This may be due in part to greater heterogeneity of the sample recruited, and less consistent or controlled data collection methods; data quality also can be a concern.<sup>6,11</sup> Pragmatic cluster randomized designs are useful for testing health system–level interventions such as changes in care pathways.<sup>12</sup> Clusters, such as specific clinics or hospitals, are randomized to an intervention, but outcomes are measured at the patient level. Because patient-level data within a cluster are correlated (intra-class correlation), analyses must account for the correlations; sample sizes using clusters as the unit of randomization are often larger than conventional trials, and power is achieved by increasing the number of clusters, not participants. The stepped wedge design is a variant of the cluster randomized design,<sup>13</sup> in which the cluster is randomized to the timing of the intervention, which is implemented in a staggered fashion. Typically, all clusters ultimately receive the intervention; thus, there are also features of a crossover design and avoidance of ethical concern when testing a hypothesis related to an intervention that is very likely to be beneficial. Herein, we highlight complex innovative designs, designs for combination therapies, and benefits of data linkage.

### Complex innovative designs

Clinical trials with adaptive trial designs refer to a group of clinical trial designs that offer pre-planned opportunities to use accruing data to modify aspects of an ongoing trial.<sup>14</sup> They use a pre-specified statistical analysis plan to preserve the validity and integrity of the trial, such as control of type I error rates. Modifiable components include the eligibility criteria (adaptive enrichment design), sample size, allocation ratio (response-adaptive randomization), study intervention, or dose.<sup>14,15</sup> Sequential designs, the most common type of adaptive trial design utilized, can reduce the required sample size and shorten trial duration by allowing the trial to be stopped early for superiority or futility in the case of overwhelming evidence. However, the potential efficiency gained from using adaptive trial designs comes with statistical and operational complexities.<sup>16</sup>

The slow process of trial development and start-up of trials contributes to slow progress in identifying efficacious new therapies. Platform (or multi-arm

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**Table 1.** Key features, strengths, limitations, and applications of novel trial designs in multiple sclerosis.

Design	Key features	Strengths	Limitations	Appropriate applications
Adaptive trials	<ul style="list-style-type: none"> <li>• Various possible types and designs; ultimate advantage/ focus being the inclusion of defined points/criteria for modification of the trial design to achieve greater efficiency</li> </ul>	<ul style="list-style-type: none"> <li>• Savings for time, cost, sample size, patient exposure.</li> </ul>	<ul style="list-style-type: none"> <li>• Greater statistical and logistical requirements.</li> </ul>	<ul style="list-style-type: none"> <li>• Broad; depends on goal and type of trial utilized</li> </ul> <p><i>The full table in Supplemental Materials outlines these in depth</i></p>
Platform multi-arm multi-stage	<ul style="list-style-type: none"> <li>• Multiple therapies evaluated on a single-disease group, divided into arms, against a single control group.</li> <li>• Predefined interim analyses determine whether a treatment will proceed to next stage analysis or discontinued.</li> <li>• Additional therapies can be added at predefined time points.</li> </ul>	<ul style="list-style-type: none"> <li>• Built-in progression from Phases 2 to 3 if interim outcomes are met.</li> <li>• Opportunity to increase the control group rather than experimental arms (potential to limit cost).</li> <li>• Opportunity to test new hypotheses/ arms during recruitment, while still controlling family-wise errors.</li> <li>• Shorter time and cost requirements compared to individual Phase 2/3 trials for different agents.</li> </ul>	<ul style="list-style-type: none"> <li>• Inherent operational and design challenges.</li> <li>• Complicated design/statistical issues depending on arm retention/additions, with implications for funding and logistics.</li> <li>• Underlying assumption is that all treatments work equally well under the null hypothesis (i.e. no one is better than any other).</li> <li>• Greater upfront cost.</li> <li>• Rely on valid, reliable intermediate outcomes that accurately predict the primary outcome.</li> </ul>	<ul style="list-style-type: none"> <li>• For use when multiple promising treatments for Phase 2/3 studies are available, with no strong belief that one treatment will be more effective than another.</li> <li>• Requires availability of adequate funding, and number of patients for enrollment.</li> <li>• Requires suitable intermediate outcome measure/s which correlates with the primary outcome measure (when the platform is designed for early phase adaptive trials).</li> </ul>
Futility designs	<ul style="list-style-type: none"> <li>• Phase 1/2 screening trial design for treatments of interest.</li> <li>• The null hypothesis is that the treatment of interest will increase the number of treatment successes by a minimal clinically significant amount.</li> </ul>	<ul style="list-style-type: none"> <li>• Optimizes early phase trial times.</li> <li>• Requires minimal sample sizes, utilizing historic controls as the trial's control arm and to generate the likely outcome without treatment effect, and the clinically significant effect.</li> </ul>	<ul style="list-style-type: none"> <li>• Requires accurate predictions of likely natural disease progress without effective treatment, and agreement that the proposed treatment success rate is indeed clinically significant.</li> <li>• Risk of bias from unblinded treatment and reliance on historic controls.</li> <li>• Positive trial result does not support treatment efficacy but only indicates non-futility.</li> </ul>	<ul style="list-style-type: none"> <li>• For use in Phase 1 and 2 studies screening translational treatments of interest rapidly.</li> <li>• Particularly suitable for repurposed drugs.</li> </ul>
Pragmatic cluster randomized	<ul style="list-style-type: none"> <li>• Randomization, or control of exposure, to new treatment/s to clusters of patients rather than individuals.</li> <li>• Utilization of established registries to monitor outcomes.</li> </ul>	<ul style="list-style-type: none"> <li>• Benefit of limiting three major unquantifiable errors in large-scale interventions, time-dependent confounding, the Hawthorne effect, and regression-to-the-mean.</li> <li>• Significant cost-saving by utilizing registries for monitoring outcomes.</li> </ul>	<ul style="list-style-type: none"> <li>• Sample size estimations and statistics are complicated and need to consider the number of clusters, calendar-time, inter-cluster correlations, observations per cluster, and ultimate detail of the design.</li> <li>• Greater potential for underlying variability of quality of data collection, and missing data fields.</li> </ul>	<ul style="list-style-type: none"> <li>• Suitable for large-scale projects, such as national or healthcare-wide interventions, assessment of clinical pathways, or initiation of electronic records.</li> </ul>

Note: Refer to full table in Supplemental Material for details of the different trial designs within each heading.

multi-stage, MAMS) protocols are characterized by planned flexibility with respect to interventions (Supplemental Appendix Figure e1), but remain infrequent designs in neurology.<sup>17,18</sup> They enable several interventions to be evaluated using a common control that can change over time by establishing an overarching protocol document referred to as a master or core protocol.<sup>17</sup> Platform trials aim to act as a long-term or perpetual clinical trial infrastructure in which different interventions can enter and leave at different times.<sup>18</sup> Platform trials are often conducted with adaptive trial designs to screen multiple interventions rapidly.<sup>19</sup> For instance, the STAMPEDE (Systematic Therapy in Advancing or Metastatic Prostate Cancer: Evaluation of Drug Efficacy) trial is the longest ongoing adaptive platform trial and changed the standard of prostate cancer care.<sup>20,21</sup> For progressive MS, the OCTOPUS trial (ISRCTN 14048364) is currently testing metformin and alpha-lipoic acid with plans to add additional therapies.

Platform trials require more time and financial investment to set-up initially than conventional trials, but the use of a common infrastructure ultimately reduces the costs and time required relative to number of interventions assessed.<sup>22</sup> These trials require careful planning, collaboration, and input with respect to clinical, operational factors, and statistical considerations.<sup>23</sup> Appropriate outcome measures are critical. Interim outcomes, such as imaging outcomes commonly used as intermediates in Phase 2 designs in RRMS, can be used to rapidly identify unsuccessful arms. However, the intermediate outcomes would need to be adapted to the study population, question of interest, and therapy's mechanism of action; for example, ocular coherence tomography in a neuroprotection trial. These intermediate outcomes must be able to accurately predict the effect of the intervention on the primary outcome of interest.

Other designs that are conducted under the master protocol framework include basket (single treatment applied to multiple conditions) and umbrella trials (single condition treated with multiple approaches),<sup>17</sup> which originated from precision oncology, driven by the increased power of genomic differentiation of cancer subtypes.<sup>24</sup> These designs are not yet applicable to MS.

The futility, or non-superiority, design can be employed to rapidly screen potential therapies, particularly when considering repurposed drugs.<sup>25</sup> First used in oncology, they are starting to be applied in MS.<sup>26</sup> Futility studies do not use contemporary controls but rely on a clear understanding of the natural

history of the disease, that is, how the disease would evolve in untreated individuals, and whether this historical rate is still applicable. The simplest design employs an open-label design with one arm. The failure threshold is based on the natural history of disease progression, and the success threshold is based on existing treatments or other clinically meaningful effect. The Gehan<sup>27</sup> model uses two stages. In the first stage, participants are enrolled, and if there are no treatment successes, the intervention is deemed futile. If there are  $\geq 1$  treatment successes, the trial moves on to the next stage, adding more participants based on the number of successes in the first stage. This design is challenging due to the variability in sample size and permits ineffective drugs to move forward by allowing a drug with only one treatment success in stage one to do so. Fleming extended this design to include two or three stages, to include a fixed rather than variable sample size, and to allow termination after the first stage if the treatment is very effective or very ineffective.<sup>28</sup> The popular Simon two-stage model is a further development of these earlier futility designs. It comes in two design variations that affect sample size and futility thresholds.<sup>29</sup> The optimal design minimizes the expected sample size for the first stage, while the minimax minimizes the overall sample size. Futility trials allow for much smaller sample sizes than traditional randomized controlled designs, but they have a higher risk of bias due to reliance on historical controls and the lack of blinding. Futility designs should not be used in populations where spontaneous improvement occurs, and the rate of disease worsening must be predictable; notably, progressive MS may not always meet these conditions. Futility trials can only identify interventions which merit further testing, but are not definitive as they do not provide support of efficacy, only lack of futility. To date the futility design has been used to test domperidone in secondary progressive MS and hydroxychloroquine in primary progressive MS (Box 1).<sup>26,30</sup>

### *Bayesian designs*

Bayesian trial designs have become increasingly used, particularly in oncology and early phases of drug and biologics development,<sup>31</sup> and medical device trials.<sup>32</sup> The US Food and Drug Administration has also supported development of Bayesian adaptive trials.<sup>31</sup> In the classic frequentist framework, the *p*-value estimated in clinical trials represents the probability of obtaining the observed or a more extreme treatment effect, given that the null hypothesis is true. The Bayesian methodology allows us to estimate the probability of each size of a treatment effect, after observing

**Box 1.** Planning a Simon two-stage (minimax) design study for primary progressive MS.<sup>22</sup>

<b>Natural history:</b>	40% of people with primary progressive MS fulfilling the inclusion criteria are expected to worsen per year*
<b>Clinically meaningful benefit:</b>	20% of trial participants worsen per year
<b>Set threshold based on:</b>	type 1 error: 5%, type 2 error: 20%
Hydroxychloroquine (HCQ) successful if < 10 of 35 participants worsen $\geq 20\%$ on timed 25-foot walk	
<b>Stage 1 (interim) analysis</b>	
$n = 13$ participants, max 4 can worsen for the trial to continue	
<i>(In the HCQ in PPMS trial, 2 of 13 participants worsened, so the trial continued into the second stage)</i>	
If successful, proceed to next stage. Enroll 22 more participants (total $n = 35$ )	
<b>Stage 2 (final) analysis</b>	
$n = 35$ , max 9 can worsen for the drug to be deemed non-futile	
<i>(In the HCQ in PPMS trial, 8 of 35 participants worsened, so HCQ was deemed non-futile)</i>	
*Based on the INFORMS and PROMISE trials	

the results of the trial (the so-called posterior probability distribution). Two components are needed to estimate a Bayesian posterior distribution: the probability of the observed data given the value of a parameter (i.e. the frequentist probability coming from the experiment) and the prior knowledge about the parameter (the prior distribution).

The Bayesian approaches are usually adopted for two reasons. The first is to overcome mathematical limitations in the frequentist framework or to have an independent confirmation of treatment results. In this case, the prior distribution is often defined to be “non-informative.” That is, a distribution that assigns all the values the same probability and suggests no prior knowledge about the treatment effect. The second is to “update” prior evidence such as the size of a treatment effect with the results of our experiment. In this case, we use an “informative” prior, that is a probability distribution telling us the prior evidence about the effect size of a drug. The main obstacle to the application of Bayesian methods is the subjectivity of the prior distribution, but this can be built using evidence-based methods, such as meta-analytic predictive priors that are based on a meta-analysis of previous studies.<sup>33,34</sup>

The Bayesian clinical trials often have better operating characteristics, such as lower sample size requirements, when significant prior information is available,<sup>35</sup> than clinical trials conducted under frequentist statistical framework, while being able to meet the frequentist

type I error rate control.<sup>36</sup> A possible application in MS research of Bayesian approaches is in trials for children with MS testing therapies that have been evaluated in adults (see Box 2 for an example).<sup>37,38</sup> Conventional frequentist clinical trials for pediatrics may require similar sample size requirements as adult trials. Since MS is rare in children, it is often not feasible to conduct clinical trials with large sample sizes unless the trial is powered based on large, potentially unrealistic, treatment effects. The pediatric MS trials are likely too small to detect clinically meaningful effects as a result. Under the Bayesian framework, we may explicitly apply adult clinical trial data as the prior evidence to be incorporated with the pediatric data (the likelihood) to overcome this challenge of conducting pediatric MS trials. If a drug candidate is shown to be efficacious in adults, it might be plausible that the same drug may also be efficacious in children with MS.

#### *Designs for combination therapies*

Most clinical trials of DMTs in MS have tested single (mono) therapies.<sup>39,40</sup> Improvements in the management of the disease may require developing combination therapies that address multiple pathophysiologic mechanisms underlying disease activity and progression in MS.<sup>41</sup> Broadly, combination therapies use two or more therapies together, either simultaneously, as add-on therapy, or as sequenced approaches.<sup>40</sup> They may share a common target or pathway or may target

**Box 2.** Bayesian trials for pediatric multiple sclerosis.<sup>37,38</sup>

Frequentist approach	Bayesian approach
Inferences based on all possible data generated by the experiment, but all possible data not actually observed	Dependent upon data observed in the current experiment
Parameters fixed, but true parameter unknown	Parameters represented by probability distribution
Point estimates include maximum likelihood or least squares estimates	Point estimates include summary statistics of the posterior distribution (e.g. mean, median, and mode)
<i>p</i> -value represents probability of observing the same results, or more extreme results in the sample, if the null hypothesis is true in the population from which the sample is drawn	Posterior probability represents the probability of the null hypothesis
X% confidence interval represents an interval that would contain the true parameter value in X% of repeated samples	X% credible interval represents an interval that contains the true parameter value with X% probability
<p>Safety and Efficacy of Teriflunomide vs Placebo in Paediatric Multiple Sclerosis (TERIKIDS) Study</p> <p>Outcome: time to first relapse</p> <p>Frequentist approach (as published):</p> <p style="text-align: center;">↓</p> <p>HR = 0.66; 95% CI = 0.39–1.11</p>	
<p style="text-align: center;">→</p> <p>Bayesian approach: incorporate information from pooled effects of the TEMSO and TOWER trials in adults (HR = 0.68; 95% CI = 0.58–0.79)</p> <p style="text-align: center;">↓</p> <p>HR = 0.67; 95% CI = 0.51–0.87</p>	

different disease mechanisms. Such combination therapies may have additive or synergistic effects, thereby improving treatment response or mitigate harm by allowing the use of lower doses of the individual therapies. Challenges in identifying successful combinations of therapies in MS include the poor ability of preclinical models to predict additivity or synergism, potential interference of one therapy with the other’s efficacy, and unintended off-target effects due to the combination. Choice of outcome measure is more complicated if multiple mechanisms are targeted, and implementation of the trial is more complex.

Modern model-based early phase trial designs could be utilized to improve the efficiency and potential success of identifying successful combinations of therapies in the future.<sup>42</sup> Later phase trials using factorial designs or adaptive trial designs (e.g. multi-stage multi-arm) can be considered in evaluating efficacy of therapeutic combinations.<sup>43</sup> Regulators usually require that a combination therapy is compared to each component separately to demonstrate the combination is better than either alone to accept the risk of multiple drugs when one might suffice. Factorial designs test the effect of two or more therapies with multiple levels that are crossed. These designs require that each intervention can be administered without changing the dose when administered in combination with the other. Factorial designs allow more efficient testing of two interventions, as fewer patients are needed than if the therapies are tested separately, although interactions between therapies can increase sample size. The COGEx trial,

for example, is a randomized, blinded, sham-controlled trial that is testing whether the combination of cognitive rehabilitation and exercise interventions is more effective than the individual therapies and control conditions for improving processing speed deficits in people with progressive MS.<sup>44</sup>

*Data linkage*

In observational studies, linkages are often used to obtain data that are not available in a single source to support data quality assessments and to expand the scope of research inquiries. In contrast, a scoping review of publications between 1945 and 2016 identified only 113 clinical trials that used linkage,<sup>45</sup> including one in MS.<sup>46,47</sup> Yet, extending clinical trials across the explanatory-pragmatic continuum by linkage to external data sources, such as health claims data (Box e1), cancer or vital statistics registries offers the opportunity to examine a broader range of outcomes during the trial or to evaluate long-term effectiveness and safety of pharmacologic and/or non-pharmacologic interventions (e.g. extension phase) while minimizing the burden on participants and clinicians.<sup>48</sup> Notably, 18.6% of the linkage-based studies in the scoping review identified long-term benefits, and 9% identified harms that were shown only in the extension phase.<sup>45</sup> The use of real-world data sources can support examination of outcomes relevant to the health system and society such as hospitalizations, admission to long-term care, healthcare costs, or use of social services.<sup>49</sup> This is important when clinical trials have

**Table 2.** Considerations related to use of data linkage in clinical trials.

Advantages	Disadvantages	Other considerations
<ul style="list-style-type: none"> <li>• Low burden on participants and trial sites</li> <li>• Comparatively low cost to primary data collection</li> <li>• May minimize selection bias and loss to follow-up if all participants in prior trial agree to participate<sup>51</sup></li> <li>• Can establish external comparator group<sup>52</sup></li> <li>• Ability to capture outcomes non-traditional outcomes such as admission to long-term care and use of social services</li> </ul>	<ul style="list-style-type: none"> <li>• Endpoints limited to those captured in the data source. Complex clinical, performance-based, and imaging measures often not captured</li> <li>• Endpoints need to be validated and may not be available across all jurisdictions of interest</li> <li>• Healthcare use may differ due to participant characteristics unrelated to the intervention</li> </ul>	<ul style="list-style-type: none"> <li>• Participant consent</li> <li>• Nature of linkage (probabilistic or deterministic)</li> <li>• Completeness and accuracy</li> <li>• Timing of extensive phase relative to parent trial</li> <li>• Availability of standardized definitions for variables to be used<sup>53</sup></li> <li>• Time and administrative burden of data access and regional variation in access processes</li> </ul>

short follow-up of 2–3 years, but where long-term outcomes are relevant for clinical decisions and policies. Extension trials in MS typically use a traditional site-based approach but can be designed to rely exclusively on data linkages across multiple jurisdictions.<sup>49</sup> Alternatively, hybrid models that capture typical clinical trial outcomes can be enriched by data linkages to capture additional outcomes. The decision to use data linkages should consider the reason for the linkage, desired endpoints, timing of the data linkage relative to the parent trial, participant burden, costs, data quality, and response of regulators (Table 2).<sup>49</sup> A feasibility study in a lymphoma population suggests that such extension studies are highly acceptable to most clinical trial participants and research ethics boards.<sup>50</sup>

### Outcome measures

A critical component of any clinical trial is the outcome measures; the primary outcome determines trial duration and sample size. Clinical trials in MS may include one or more types of outcome measures, including clinician-assessed, performance-based, patient-reported outcomes, and biomarkers. The primary outcome measure used has varied across trial phases and populations in MS. Phase 2 trials in RRMS generally rely on intermediate outcomes such as magnetic resonance imaging (MRI) endpoints, whereas Phase 3 trials have relied on clinical endpoints such as relapse rates or disability progression (the Expanded Disability Status Scale [EDSS] score). Similarly, most Phase 3 clinical trials in progressive MS have relied on clinician-assessed progression as the primary outcome,<sup>54</sup> despite poor responsiveness of the EDSS to

evolution of progressive disease, particularly among individuals with higher baseline EDSS scores. Although preservation of cognition is rated as important by people with MS, it is insufficiently assessed in most DMT trials,<sup>54</sup> often relying on a single performance-based measure. Responsiveness of some, although not all, commonly used patient-reported outcomes is also inadequate or poorly understood,<sup>55,56</sup> and clinical trials frequently do not include outcomes that reflect the impact of interventions on activities and participation for people with MS. Outcome measures need to be meaningful, reflect the underlying construct of interest, be valid, reliable, and responsive.

### Composite outcomes

Composite endpoints combine multiple clinical outcomes (components) that reflect a common underlying disease process. The endpoint is defined as the occurrence of any of the specified outcomes in a patient. For example, evidence of disease activity is a composite endpoint created using additive meaningful components that includes relapses and changes in disability and MRI activity.<sup>57</sup> Another example would be disability progression identified based on meaningful worsening of the EDSS (0.5–1.0 point depending on baseline value), the timed 25-foot walk (20% worsening),<sup>58</sup> the nine-hole peg test (20% worsening),<sup>59</sup> or the Symbol Digit Modalities Test (4 point decrease in raw score).<sup>60</sup> Composite endpoints are distinct from composite indicators which are separate items that are combined to create a new summary variable.<sup>61</sup> Variables that are continuous can be combined through the use of a simple or weighted average. The Multiple

Sclerosis Functional Composite is a composite outcome that includes a measure of lower limb function, upper limb function, and cognition,<sup>62</sup> by averaging *z*-scores of the original variables. A simple average works well when the strength of the relationship between the components and the independent variables is similar. Weighted averages assign weights derived from principal components analysis or from prior studies to the component variables that comprise the composite. Composite endpoints offer the opportunity to more fully capture the multi-dimensional experience of MS. The use of composite outcomes can increase event rates, thereby increasing statistical power, enabling shorter clinical trials with smaller sample sizes. However, the observed treatment effect may not apply to all components of the composite, thereby complicating interpretation and reporting with respect to individual components.<sup>63</sup> Moreover, if one component is not affected by the treatment, statistical power to detect an effect on the composite may be reduced;<sup>64</sup> power decreases as the number of non-responsive components increases. This issue becomes more complicated if responsiveness of the components varies with the baseline status (e.g. overall disability level) of the participant. Furthermore, if treatment effects on components are in opposite directions, interpreting study findings is complex.

### *Intermediate outcomes*

Clinical trials that employ intermediate outcomes require smaller sample sizes, are shorter in duration, and have higher statistical power. A clinical outcome is a direct measure of how the patient feels, performs, or survives. An intermediate outcome is a measure of a function or symptom (such as pain) which is not the ultimate endpoint of disease. Intermediate outcomes include biomarkers and replacement endpoints that are considered to assess the causal pathway through which the intervention affects the true outcome of interest;<sup>65</sup> the latter should be meaningful to the patient. In rehabilitation clinical trials, there are similar considerations with respect to outcome measures. In rehabilitation, a commonly used conceptual framework is that of the International Classification of Functioning, Disability and Health Framework. This framework includes the core domains of body function and structures, activities, participation, personal, and contextual factors. In this framework, we could consider the intermediate outcomes as those related to the “body function” under study such as lower limb strength or muscle tone. The key clinical outcomes would be those related to activities as could be measured using a six-minute walk,<sup>66</sup> and participation, as could be measured through social participation or community life, health-related quality

of life, or functional independence in daily activities (see companion paper for further discussion of these issues in rehabilitation<sup>67</sup>). Surrogate outcomes are intermediate outcomes that meet specific criteria. Specifically, the intermediate outcome must be strongly associated with the outcome of interest, and the effects of the intervention on the outcome of interest are fully captured via the intermediate.

Intermediate outcomes can be used for several reasons.<sup>68</sup> They can be used as endpoints in Phase 2 clinical trials or at the interim stage of a platform trial to determine whether the intervention merits further evaluation in a longer, more costly Phase 3 trial. In Phase 3 trials, they can be used as surrogates to allow decisions about the efficacy of treatment to be made earlier. They can also be used to test subsequent entry complex drugs or agents with the same mechanism of action as an approved agent and support approval without a Phase 3 trial. They can also be used to demonstrate the efficacy of therapy in a pediatric population where this has already been demonstrated using intermediate and clinical outcomes in an adult MS population, thereby accelerating trials in the smaller, more vulnerable pediatric population.<sup>69</sup>

The use of intermediate MRI endpoints, such as brain atrophy or new/enlarging T2 lesions, has been effective in assessing DMTs that target inflammation, predominantly in individuals with RRMS. These endpoints have been useful because the effect of DMT on MRI lesions predicts the effect on relapses;<sup>70</sup> the association between MRI endpoints and worsening disability (EDSS) is weaker.<sup>71</sup> As therapies targeting pathobiologies other than inflammation emerge,<sup>41</sup> alternative intermediates will be needed.<sup>41,72–74</sup> To be useful, a clear understanding of the biological mechanism that the intermediate outcome assesses is needed, including how specific the outcome is to that mechanism. For example, can the effects of acute inflammation and neurodegeneration be differentiated? Therefore, an understanding of how the intermediate outcome relates to the clinical outcomes of interest for a Phase 3 trial is vital. Many potential biomarkers are being proposed as intermediates; these need to be prioritized and gaps and challenges related to test–retest reliability, inter- and intra-rater reliability, sample size calculations, and general availability addressed.<sup>52,75</sup>

### *Recommendations for future MS clinical trial research*

Based on meeting discussions, attendees made several recommendations to enhance efficiency of clinical trials.



1. Access to clinical trial data sets is important to support trial design, and further development of data repositories accessible to qualified investigators is important.
2. Sustained funding, collaboration, and broad stakeholder engagement are needed to support platform trials. Opportunities for multi-national platform trials should be explored.
3. Consider evaluating and establishing a pipeline for testing candidate therapies using futility designs, then moving candidates that did not meet the futility threshold directly into a platform trial (Supplemental Appendix Figure e1). This may be particularly valuable for progressive MS and therapies targeting neuroprotection and repair strategies.
4. For DMTs being tested in pediatric MS that are already known to be effective in adults with MS, use Bayesian designs to reduce required sample sizes and likelihood of non-informative results. Intermediate outcomes may also substitute for clinical outcomes in this population. Alternatively, adaptive designs can be used to broaden trial inclusion criteria to progressively include children and youth, and older adults, over the course of the trial after careful consideration of potential differences in pharmacodynamics and pharmacokinetics between children and adults with MS.
5. Develop adaptive designs to test dose and duration of therapy required for remyelination and neuroprotective therapies, as well as rehabilitation interventions, and to identify the optimal population for treatment response.
6. Investigate acceptability to people with MS of linkages of clinical trial data with external sources to study long-term outcomes and develop standard consent language to support such data linkages.
7. Further develop, improve, and sustain existing disease registries to support pragmatic trials that can address questions such as comparative effectiveness of specific therapies or strategies or effects of specific health policies.
8. Develop biomarkers to enrich progressive MS trial populations with individuals who are likely to progress during the study period.
9. Prioritize intermediate outcomes for further development that target novel therapeutic mechanisms of action. Consideration should be given to cost, accessibility, reproducibility, and acceptability to patients:
  - (a) Standardize terminology for intermediate and clinical outcomes and standardize methods of data collection.
  - (b) Establish validity, reliability, responsiveness, and specificity of the intermediate outcome for the pathophysiological mechanism of interest.
  - (c) Estimate required sample sizes.
  - (d) Establish associations between the intermediate outcomes and meaningful clinical outcomes, including progression of physical and cognitive impairment and participation outcomes. This will require longitudinal studies—either new studies or augmenting data collection for new candidate intermediate outcomes in existing cohorts, and for a broader range of clinical outcomes that are meaningful to people with MS.

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### Supplemental Material

Supplemental material for this article is available online.

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